

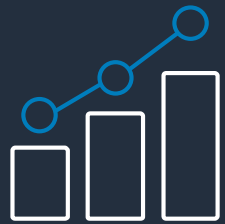


# Using Lake House approach to enable self-service analytics with AWS Lake Formation

Roy Hasson – Pr. Product Manager

# Customers want more value from their data

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**GROWING  
EXPONENTIALLY**



**FROM NEW  
SOURCES**



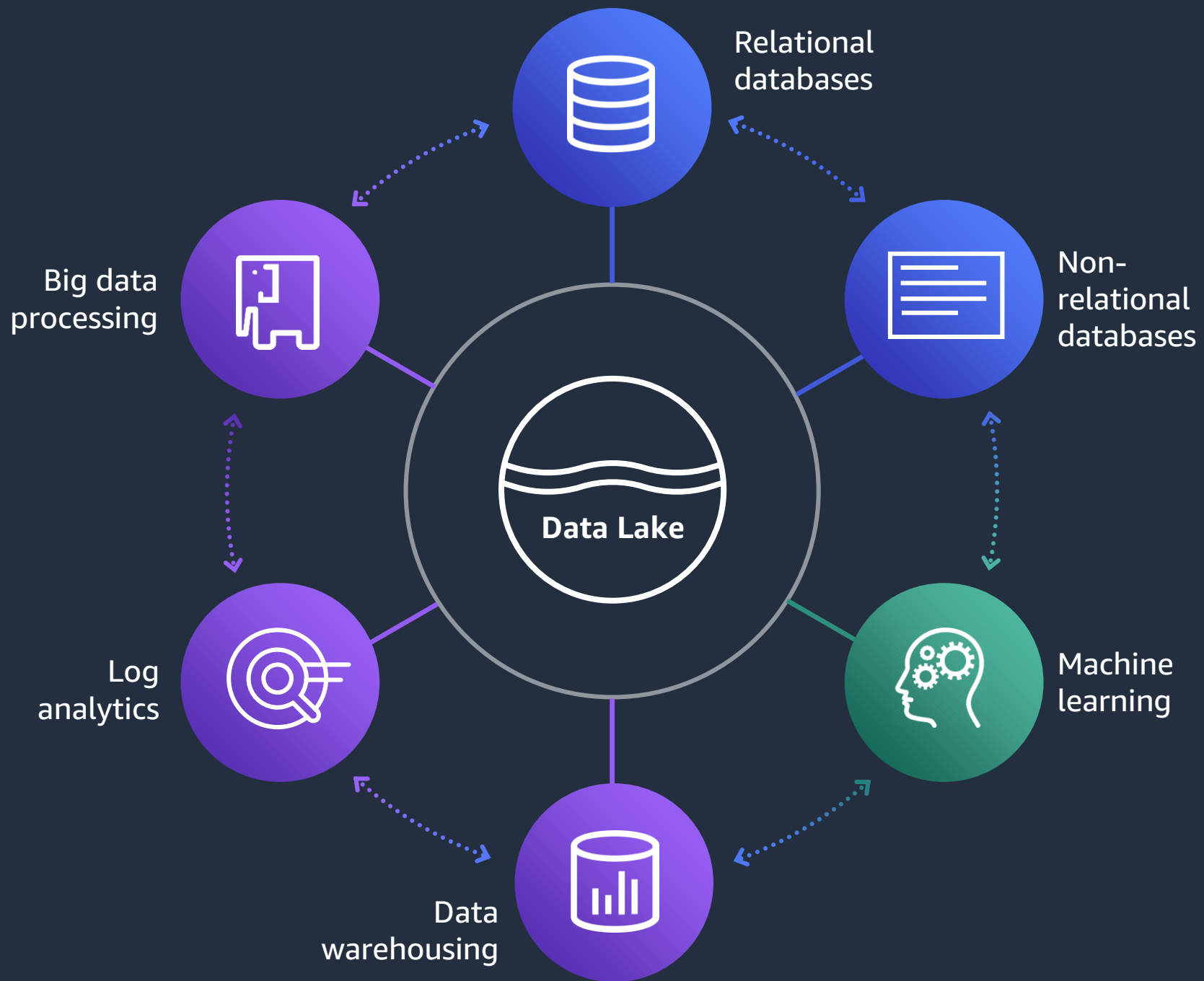
**INCREASINGLY  
DIVERSE**



**USED BY  
MANY PEOPLE**



**ANALYZED  
BY MANY  
APPLICATIONS**



# Customer data in the real world

# Lake House approach on AWS



SCALABLE DATA LAKES

PURPOSE-BUILT DATA SERVICES

AUTOMATED DATA MOVEMENT

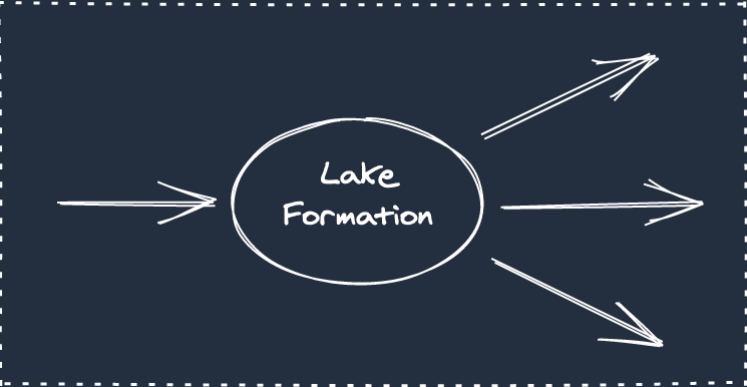
CENTRAL GOVERNANCE

PERFORMANT AND COST-EFFECTIVE



# Common architecture design patterns

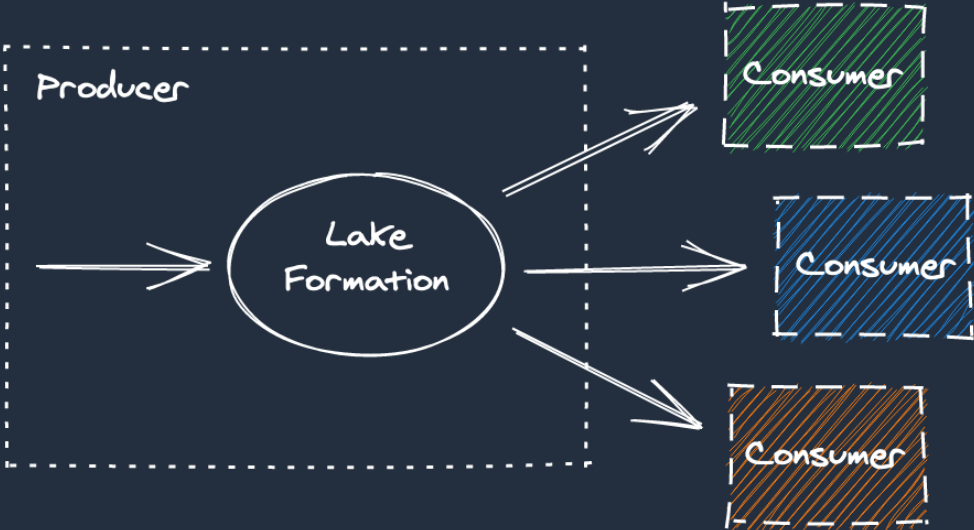
## SINGLE ACCOUNT



**CENTRALIZED  
SINGLE ACCOUNT**

**SIMPLE TO GET STARTED**

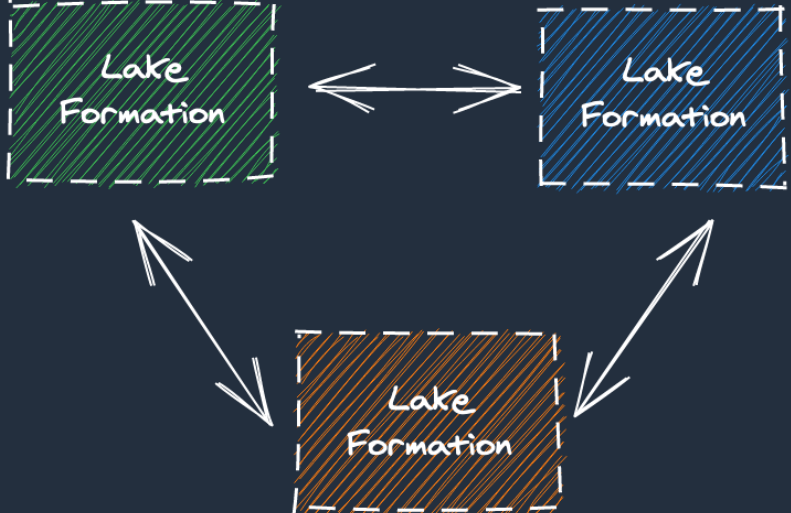
## HUB & SPOKE



**HUB & SPOKE  
MULTI-ACCOUNT**

**CROSS ORGANIZATION**

## DATA MESH



**DATA MESH  
CENTRAL GOVERNANCE**

**ORGANIZATIONAL AUTONOMY**

# Amazon S3 is the most popular storage for data lakes

Unmatched **durability, availability, and scalability**

Most **object-level controls**

**Easiest to use** with **cost optimization:**  
Intelligent tiering

**Broadest portfolio of analytics tools**

Most ways to **get data in**

Best **security, compliance, and audit** capabilities

**Cold storage and archive** capabilities



# Operationalizing data lakes on S3 is still hard

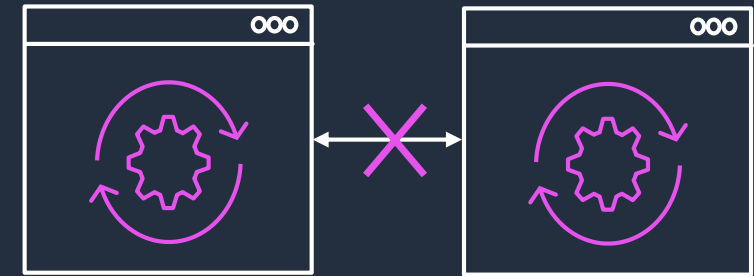
---



**DIFFICULT TO  
INSERT, UPDATE  
AND DELETE DATA**



**SECURITY AND  
GOVERNANCE IS  
COMPLEX**



**ERROR-PRONE  
COARSE GRAIN  
DATA SHARING**

# AWS Lake Formation

Build a secure data lake in days



## Build data lakes quickly

Move, store, update, and catalog your data faster  
Automatically organize and optimize your data



## Simplify security management

Centrally define and enforce security, governance, and auditing policies



## Easily discover and share data

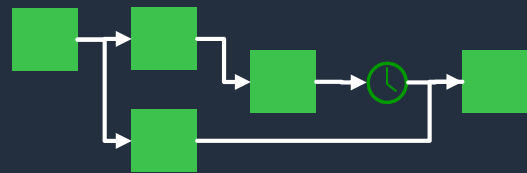
Catalog all of your data assets and easily share datasets between consumers



# Challenges in managing your data

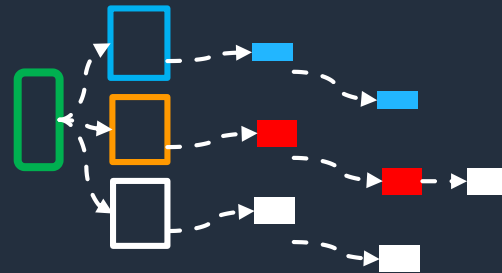
---

## CONTINUOUS UPDATES



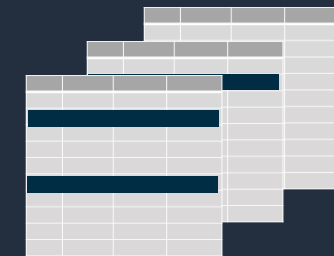
**COMPLEX ETL  
DELAYS IN DATA FRESHNESS  
EXPENSIVE, BRITTLE &  
ERROR-PRONE**

## INCONSISTENT PERFORMANCE



**OVER-SCAN DATA  
LOTS OF SMALL FILES  
PARTITION UPDATES  
MANAGEMENT OVERHEAD**

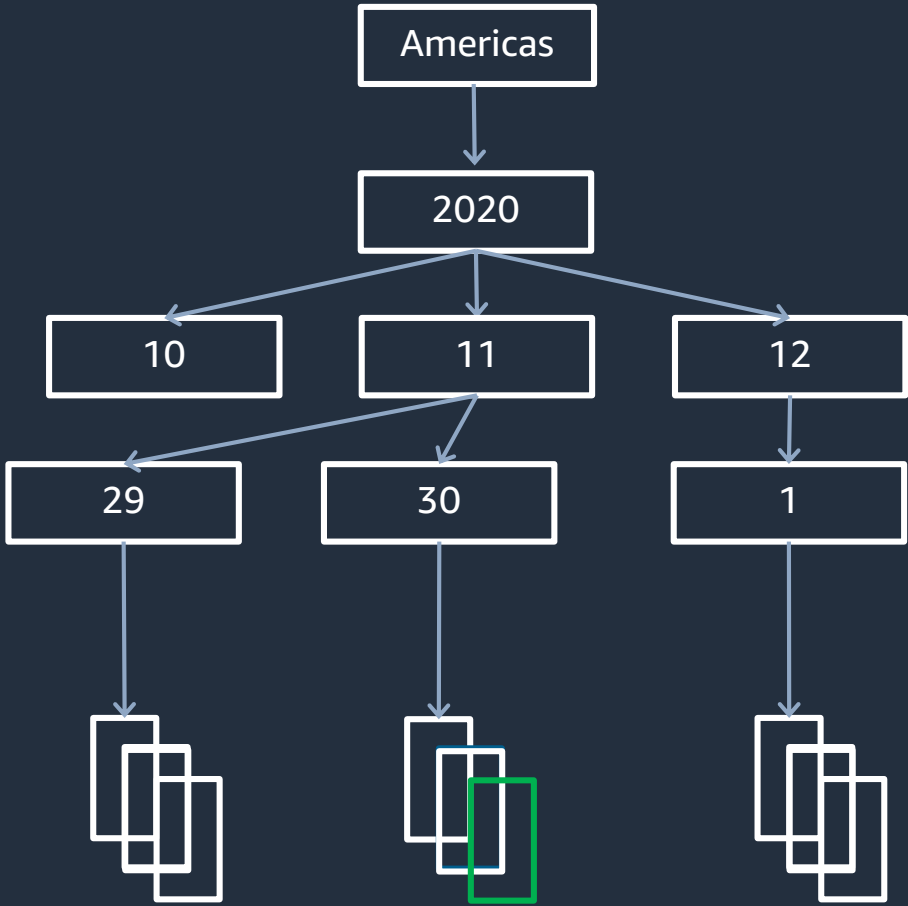
## COMPLYING WITH REGULATIONS



**DIFFICULT TO FIND  
NEEDLE IN VERY LARGE  
HAYSTACK**

# Standard external tables on S3

Apache Hive-style tables, organize data in *partitions*



S3 path following Hive-style partition

Files in open formats

```
S3://IOTDeviceData/region=Americas/year=2018/month=Nov/day=30/data1.parquet  
S3://IOTDeviceData/region=Americas/year=2018/month=Nov/day=30/data2. parquet  
S3://IOTDeviceData/region=Americas/year=2018/month=Nov/day=30/data3. parquet
```

...

# Introducing Governed Tables

New type of S3 table

PREVIEW

UPDATE  
DATA

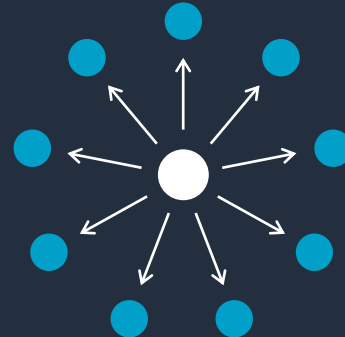


ACID TRANSACTIONS

CONSISTENT ACROSS TASKS  
INSERT, UPDATE, DELETE  
CONVERGE BATCH & REAL-TIME

RELIABLE

OPTIMIZATION  
ACCELERATION



STORAGE OPTIMIZATION

AUTO-COMPACT SMALL FILES  
PUSH-DOWN FILTERS  
REDUCE DATA SCAN

PERFORMANT

TIME  
TRAVEL



DATA VERSIONS

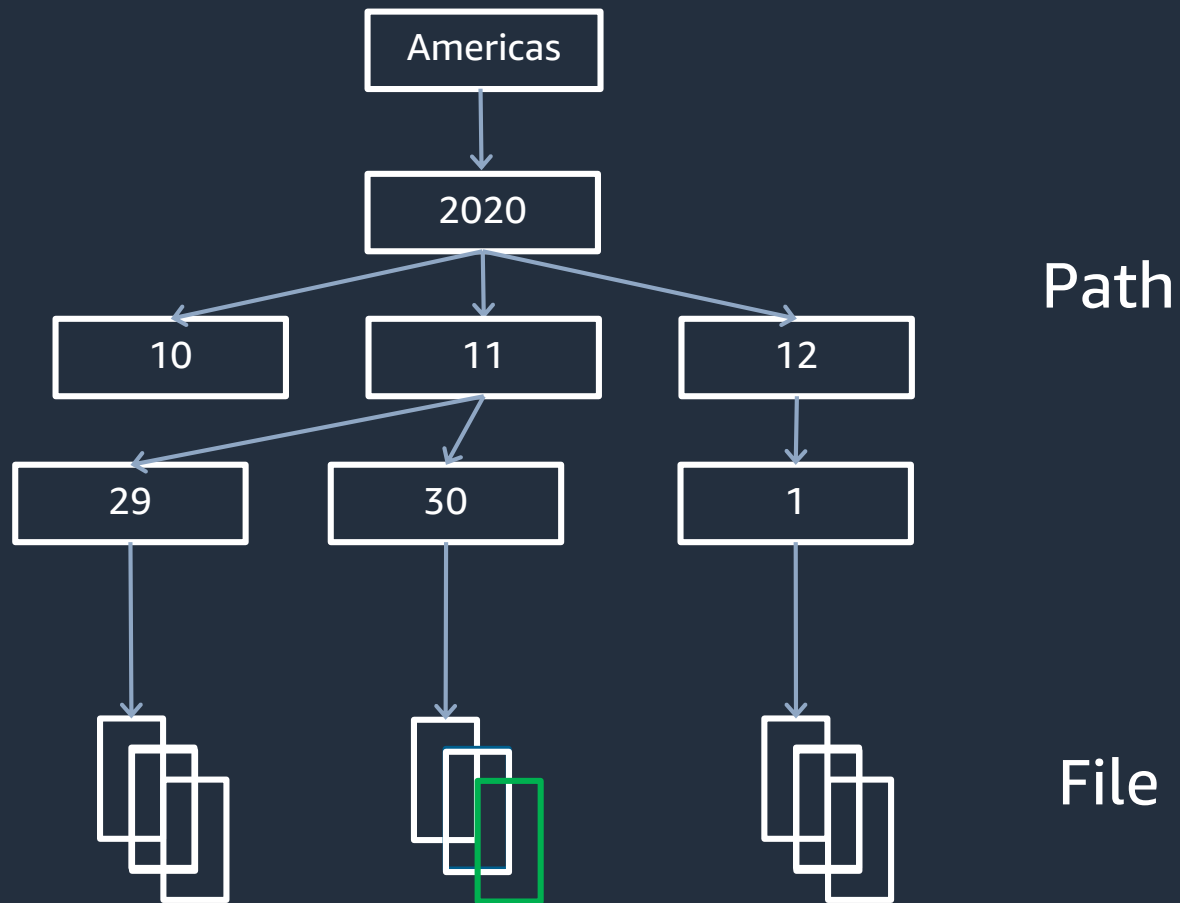
DATA HISTORY  
REPRODUCE EXPERIMENTS  
AUDIT CHANGED DATA

VERSIONED

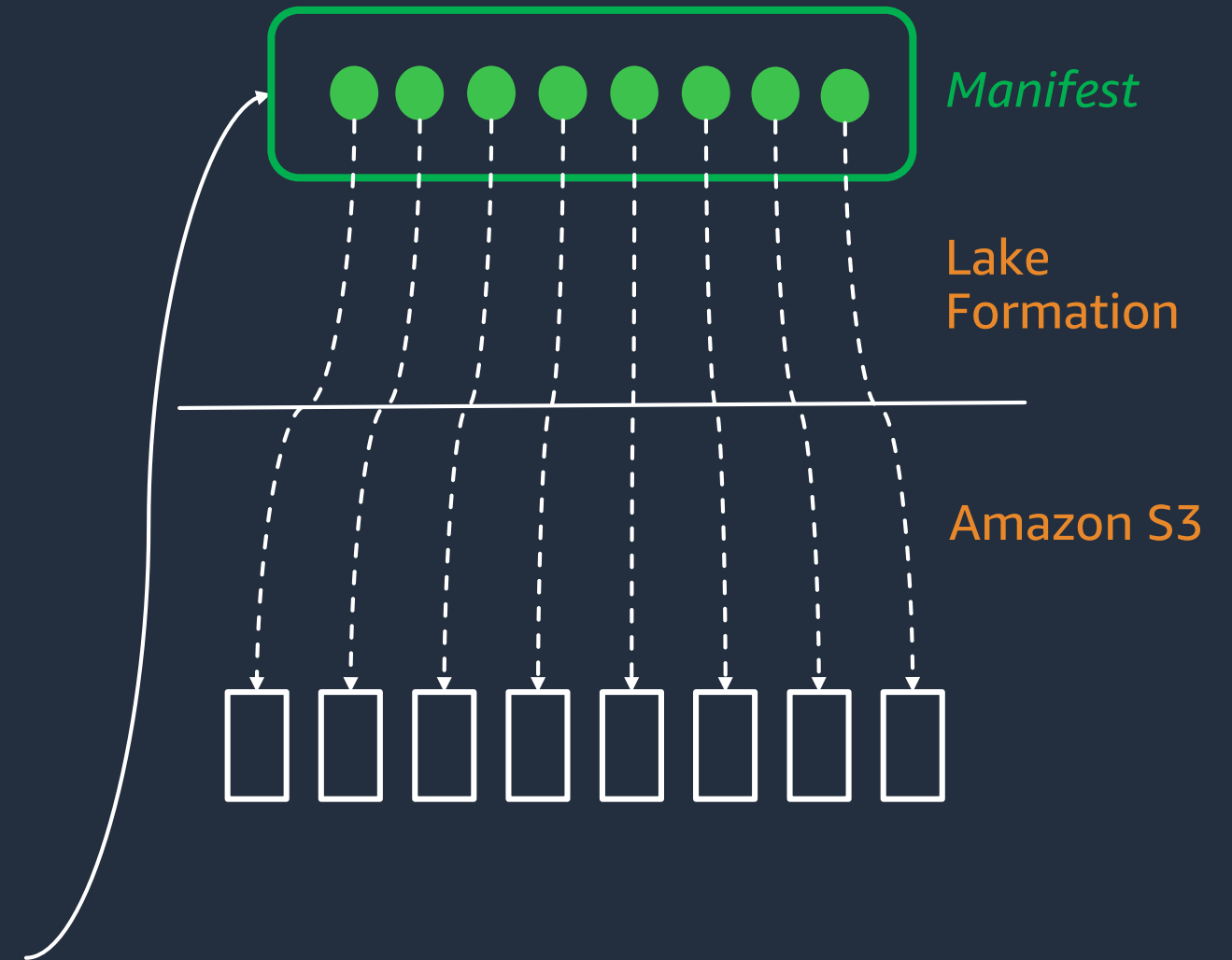
# Governed Tables: Under the hood

PREVIEW

Apache Hive-style tables



Governed Table



`S3://IOTDeviceData/region=Americas/year=2020/month=11/day=30/data1.parquet`  
`S3://IOTDeviceData/region=Americas/year=2020/month=11/day=30/data2.parquet`  
`S3://IOTDeviceData/region=Americas/year=2020/month=11/day=30/data3.parquet`

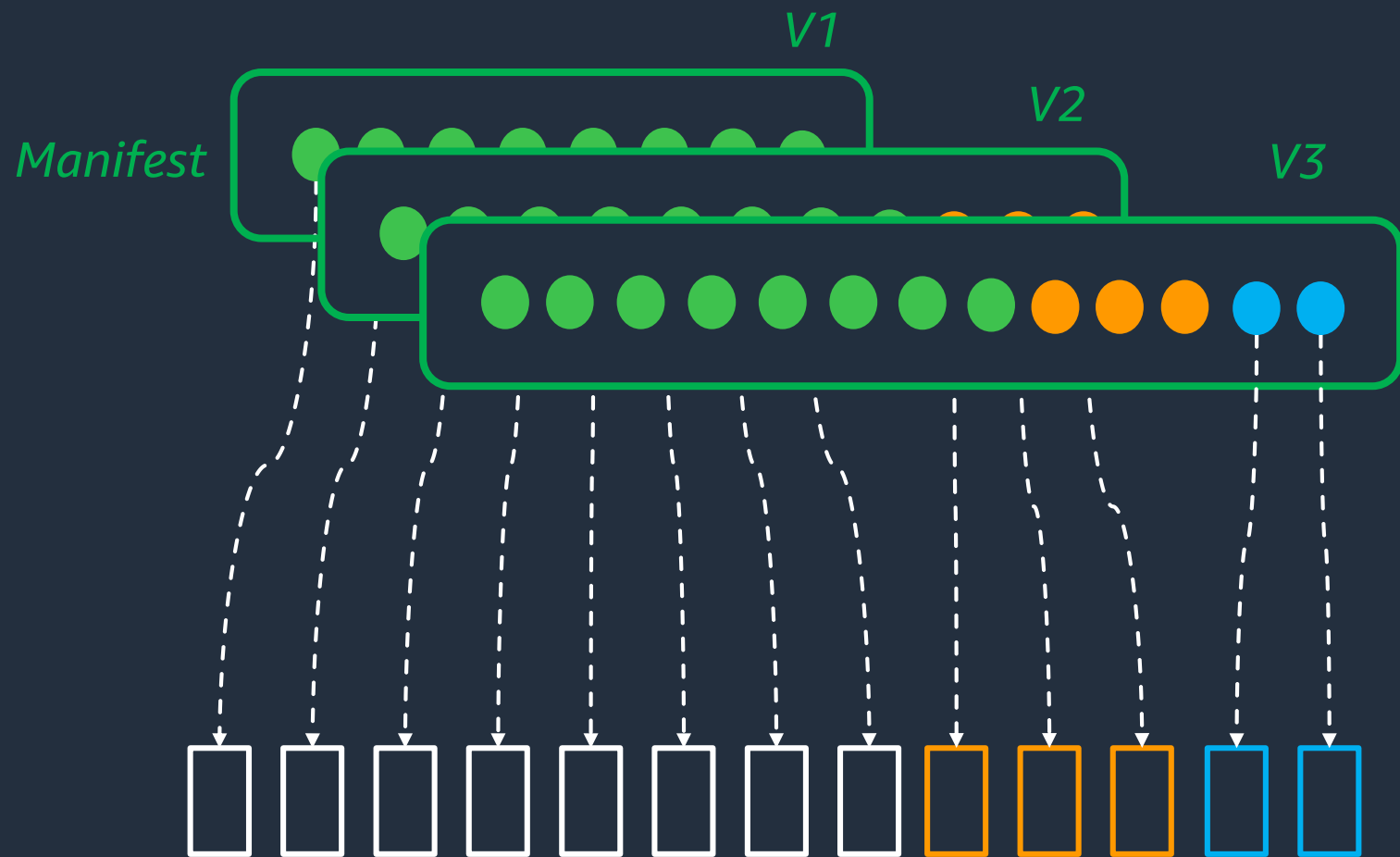
© 2021, Amazon Web Services, Inc. or its Affiliates.



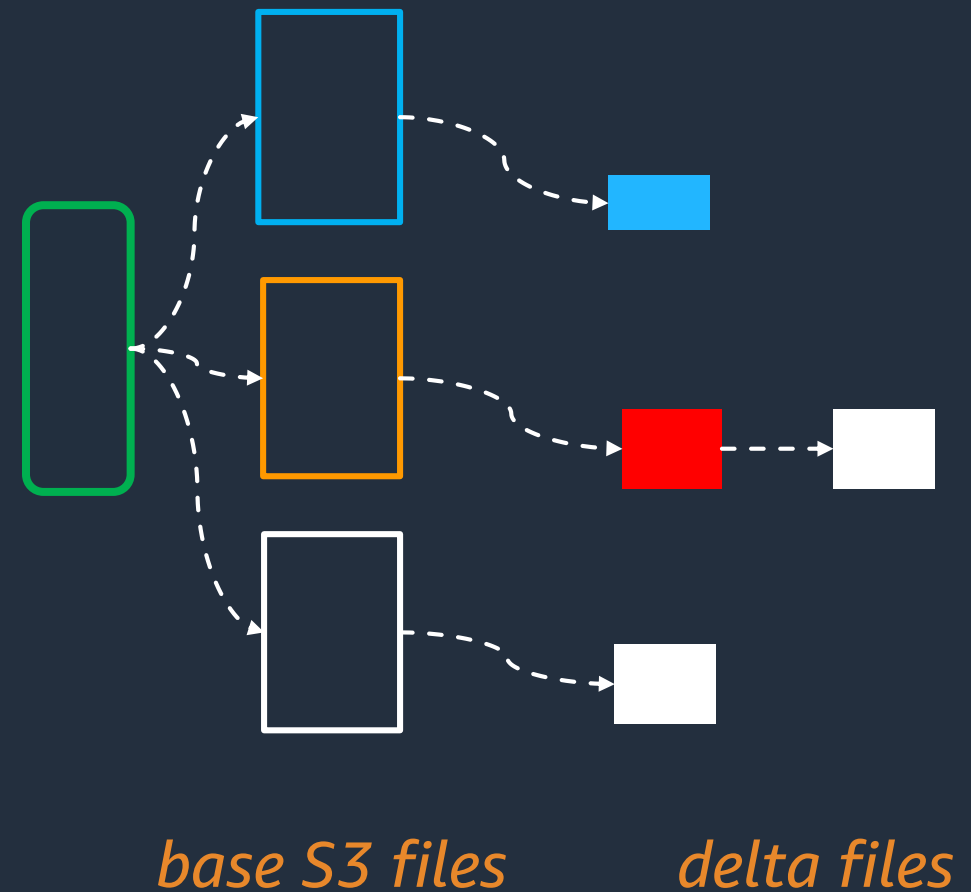
# Governed Tables: Transactions

PREVIEW

Table-based txn API:  
Add or remove files from manifest



Row-based txn API:  
Insert, update, delete rows  
delta files contain edits



# Transactions make data lakes trustworthy

---

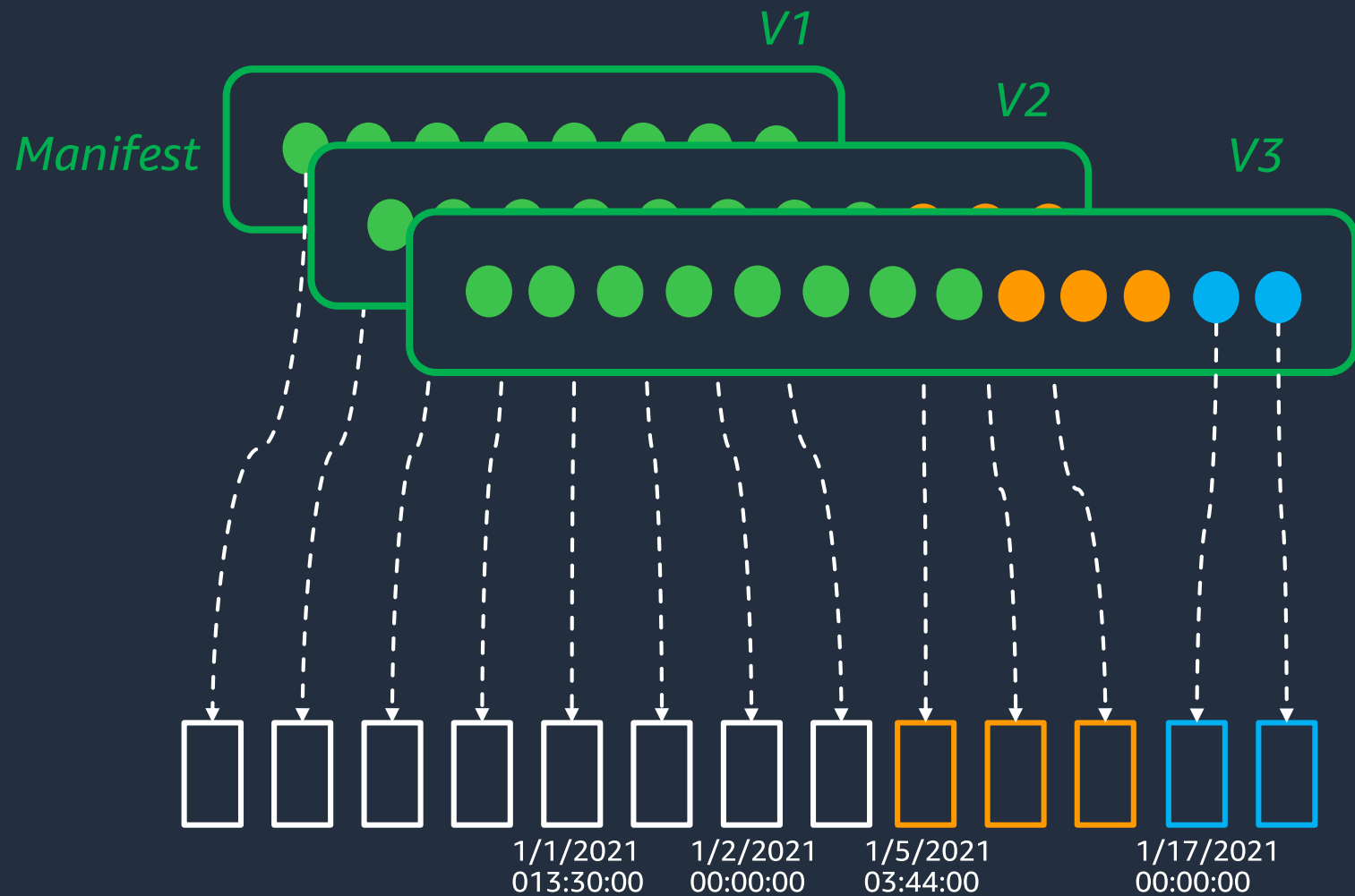


*“... Transactional ETL processes are an important part of how we ensure data integrity and ... required additional development time and complexity. We’re excited about AWS Lake Formation Transactions’ ability to simplify our ETL and reduce the overall effort needed to produce trustworthy data in our data lake.”*

Rob Hruska  
Engineering Director  
Hudl

# Governed Tables: Time travel

PREVIEW



```
SELECT * FROM gov_table  
FOR SYSTEM_VERSION AS OF V2
```

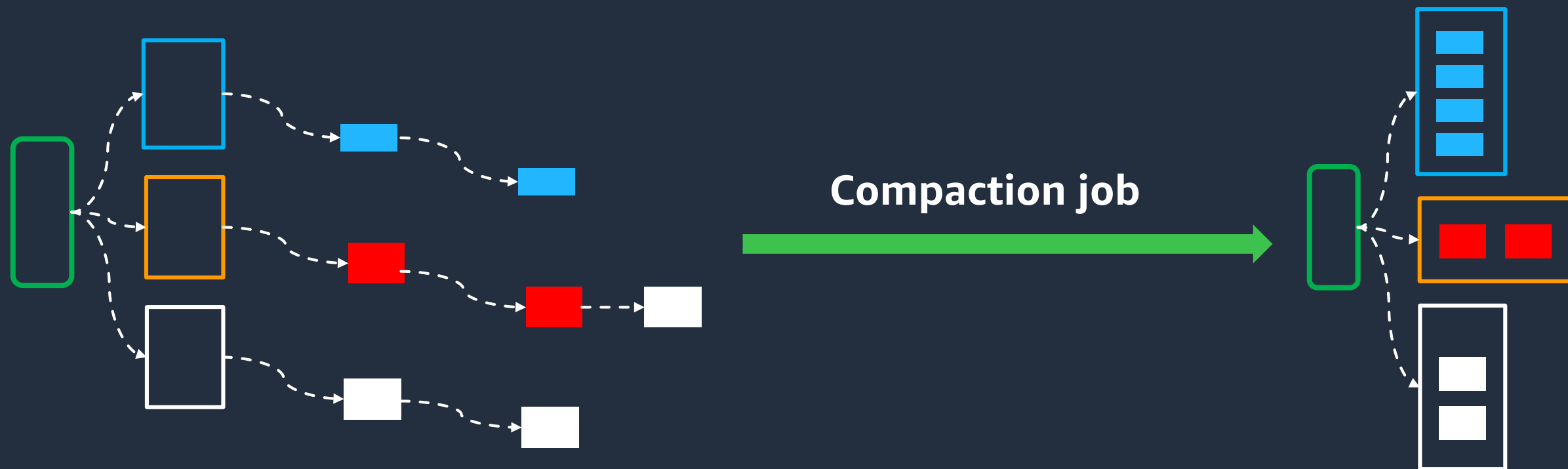
```
SELECT * FROM gov_table  
FOR SYSTEM_TIME AS OF  
'2021-01-05 00:00:00'
```

# Governed Tables: Storage optimizer

PREVIEW

## Automatic Compaction

Continuously monitors changes to underlying data of governed tables





# New way to securely access data

PREVIEW

SELECT \* FROM purchases



 **AWS Lake Formation**  

 **AWS Lake Formation – Unified Data Access APIs**

Authorize request

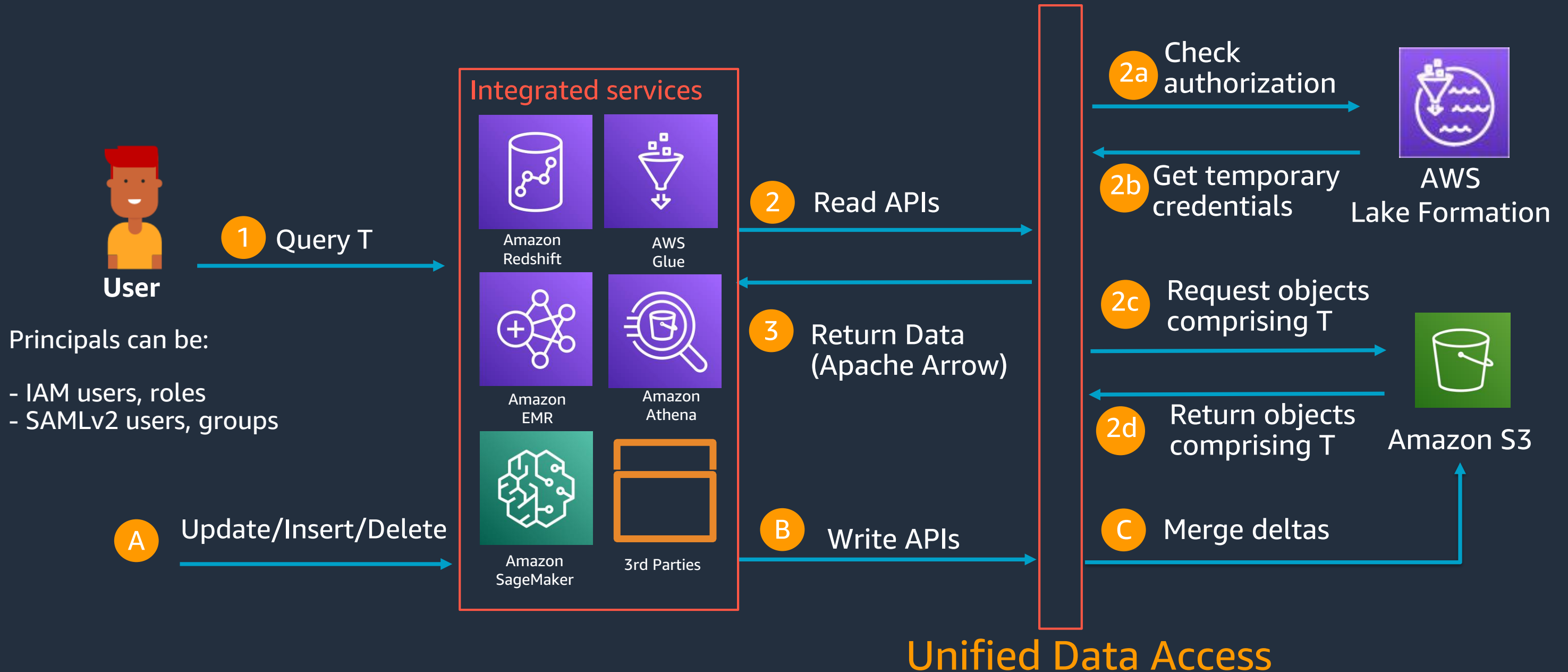


 **Amazon S3**

- Governed Table
- Parquet Table
- CSV JSON

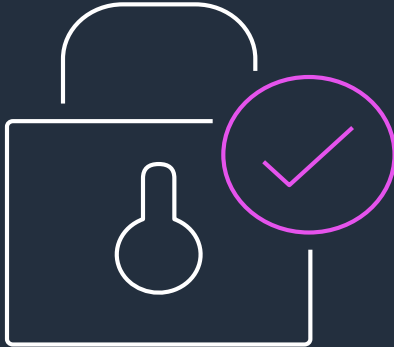
# AWS Lake Formation securely manages reads and writes

PREVIEW



# Challenges in managing security and governance

## VISIBILITY & OWNERSHIP



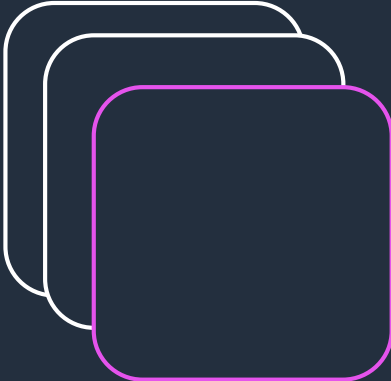
**DATA SPRAWL  
MINIMAL VISIBILITY  
DIFFICULT TO SECURE**

## ENFORCING PERMISSIONS



**GAPS IN CAPABILITIES  
INCONSISTENT  
ENFORCEMENT**

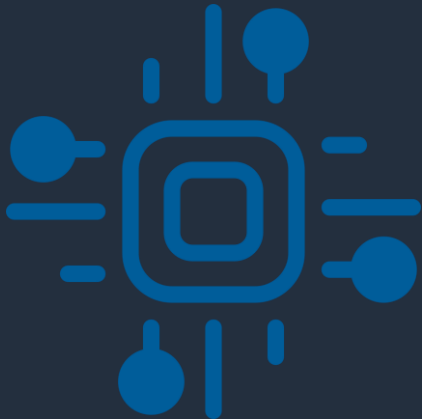
## DATA DUPLICATION



**REQUIRE ETL  
MULTIPLE COPIES  
COSTLY**

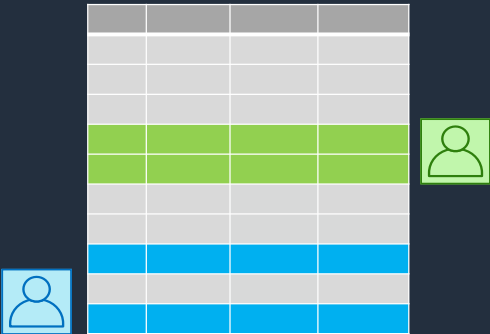
# Central governance

## CENTRAL CATALOG



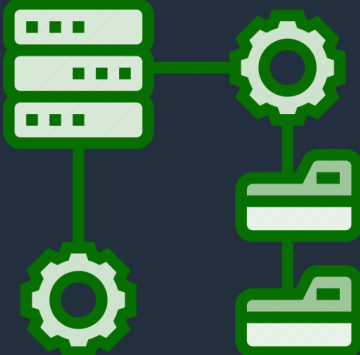
VIEW & MANAGE ASSETS  
DATA CLASSIFICATION  
ACCESS POLICIES  
AUDIT

## FINE GRAIN PERMISSIONS



CENTRALLY ENFORCED  
TABLE | COLUMN | ROW  
ATTRIBUTE

## DATA SHARING



SEAMLESS SHARING  
UBIQUITOUS  
TOOL AGNOSTIC

# AWS Lake Formation central catalog

**AWS Lake Formation** ✕

**AWS Lake Formation** > Tables

**Tables (19)**

	Name	Database	Governance	Row security
<input type="radio"/>	events_views	erie	-	-
<input type="radio"/>	raw_cloudtrail_logs	cloudtrail	-	-
<input type="radio"/>	events4	erie	Enabled	Enabled
<input type="radio"/>	lf_table_reg	cloudtrail	-	-
<input type="radio"/>	elb_logs	sampledb	-	-
<input type="radio"/>	test_csv	erie	Enabled	Enabled
<input type="radio"/>	normal_events	erie	-	Enabled
<input type="radio"/>	json_events	cloudtrail	-	-
<input type="radio"/>	csv_row	erie	-	Enabled



Data analysts & scientists

# AWS Lake Formation central catalog

### Data permissions (72)

Choose a database or table for which to review, grant or revoke user permissions.

< 1 2 3 4 ... > ⚙

	Principal	Principal type	Resource type	Resource	Owner account ID	Permissions	Grantable	RAM Resource Share
<input type="radio"/>	Admin-OneClick	IAM role	Database	default				
<input type="radio"/>	user	IAM user	Database	default				
<input type="radio"/>	Admin-OneClick	IAM role	Database	shared_data_tsets				
<input type="radio"/>	Admin-OneClick	IAM role	Database	cloudtrail				

### Classification

**Policy tag** Delete Edit

Key	Values
Classification	Sensitive, Confidential, Public

**Associated data catalog resources (35)**

Key	Values	Resource type	Resource
Classification	Sensitive	TABLE	<a href="#">events_views</a>
Classification	Sensitive	TABLE	<a href="#">raw_cloudtrail_logs</a>
Classification	Public	TABLE	<a href="#">normal_events</a>
Classification	Sensitive	COLUMN	<a href="#">events_views.town</a>
Classification	Sensitive	COLUMN	<a href="#">events_views.name</a>



Data steward

# AWS Lake Formation central catalog

**Recent access activity (0/50)** ↻ v

Recent access activity for your data lake in AWS Cloudtrail. Events can take several minutes to appear in Cloudtrail and are limited to the last 90 days.

< 1

	Event name	Principal	Alert time
<input type="radio"/>	BeginTransaction	GlueJobRunnerSession	Tue, Mar 2, 2021, 10:51 AM UTC
<input type="radio"/>	BeginTransaction	GlueJobRunnerSession	Tue, Mar 2, 2021, 3:23 AM UTC
<input type="radio"/>	BatchRevokePermissions	royon-lsengard	Fri, Feb 26, 2021, 3:40 PM UTC
<input type="radio"/>	BatchRevokePermissions	royon-lsengard	Fri, Feb 26, 2021, 3:40 PM UTC
<input type="radio"/>	ListPermissions	royon-lsengard	Fri, Feb 26, 2021, 3:40 PM UTC
<input type="radio"/>	ListPermissions	royon-lsengard	Fri, Feb 26, 2021, 3:40 PM UTC
<input type="radio"/>	ListPermissions	royon-lsengard	Fri, Feb 26, 2021, 3:40 PM UTC



Data administrator

# Lake Formation: Tag-based access control



Simple to  
manage and  
scale permissions



Decouple  
permissions  
from resources



Tag ontology for  
annotation and  
classification



# Lake Formation: Tag based access control

Easily **scale** permission enforcement

1. Define tag **ontology** centrally
2. **Tag** databases, table, columns
3. **Grant** principals access on tags



Dept=Sales



PII=true



Dept=MKTG

&

PII=true

Table: Sales Dept=Sales

PII=true

Item	Region	Email Address	Sales Price
141414	West	<a href="mailto:andy@acme.com">andy@acme.com</a>	\$65.00
124141	West	<a href="mailto:kathy@yahoo.com">kathy@yahoo.com</a>	\$41.50
135355	East	<a href="mailto:jenna@gmail.com">jenna@gmail.com</a>	\$54.10
423514	East	<a href="mailto:april@more.com">april@more.com</a>	\$81.43

Table: Mktg Dept=Mktg

PII=true

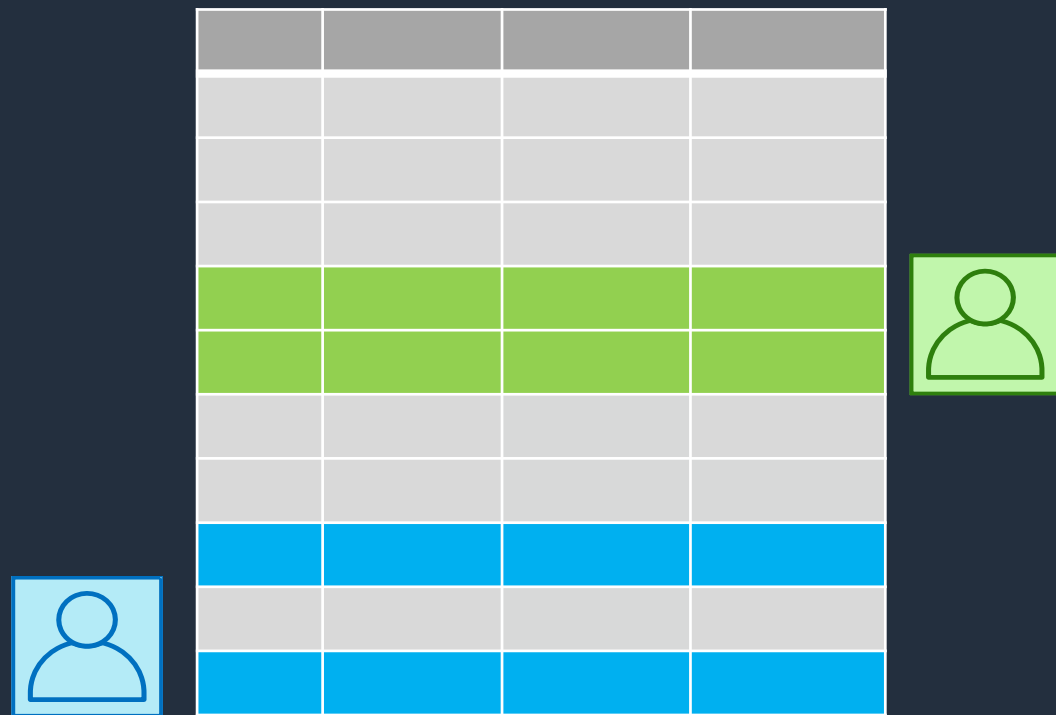
PII=true

PII=true

Email Address	First Name	Last Name	channel	Acq Costs
<a href="mailto:andy@acme.com">andy@acme.com</a>	Andy	McDowell	Facebook	\$2.00
<a href="mailto:kathy@yahoo.com">kathy@yahoo.com</a>	Kathy	Bates	Facebook	\$1.75
<a href="mailto:jenna@gmail.com">jenna@gmail.com</a>	Jenna	Bush	adwords	\$1.40

# AWS Lake Formation row-level security

PREVIEW



## Row-level security policies

---

Row filter expressions are  
"WHERE" clause in "PartiQL"

---

Supports **many** S3-based table **formats**

**Open** and **managed**

Governed, Amazon Redshift data shares, Apache Hive  
Apache Iceberg, Apache Hudi, Delta Lake, ...

---

Easy to audit permissions and access

# AWS Lake Formation cell-level security

PREVIEW

Country			IP
UK			
UK			
US			
US			



US-Non-Sensitive

Select \* where country=US

UK-Non-Sensitive

Select \* except IP  
where country=UK

Country			IP
UK			*****
UK			*****
US			
US			

Effective access with masked IP column

Cell-level policies extends row-level security

Define **cell regions** by selecting columns and rows

*Included columns: name, age, country*

*Row filter: country = 'US'*

Automatically **mask** excluded cells

Easy to audit permissions and access

# Managing data lake permissions

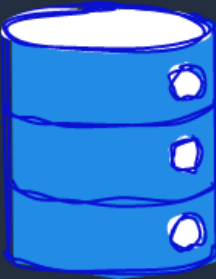
---



*“We found AWS Lake Formation **easy** to **use** to **build** and **secure** our data lake. Without AWS Lake Formation, we would have to **make constant access policy updates** to Amazon S3 when we added more users and data . . . With the adoption of AWS Lake Formation, we are able to . . . reduce Amazon **S3 policy edits by over 90%** . . .”*

Hisatoshi Imaoka  
Tech. Lead Data Infrastructure  
freee K.K.

# Data sharing made simple with Lake Formation



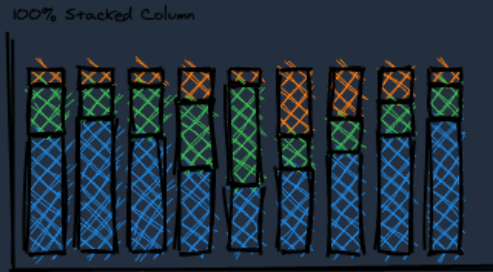
Share entire database



Share multiple tables



Share columns & rows



Amazon QuickSight



Amazon Redshift



AWS Glue



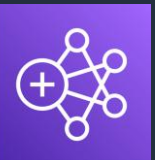
Amazon SageMaker



Amazon Athena



3rd Party ISV



Amazon EMR

# Sharing data lakes across accounts



*"... We are building a **hub-and-spoke architecture** using AWS Lake Formation where data producers can **publish** their sharable data to a centralized data catalog and data subscribers can **request access** to that data from the centralized data catalog."*

Charles Beadnall  
CTO  
GoDaddy

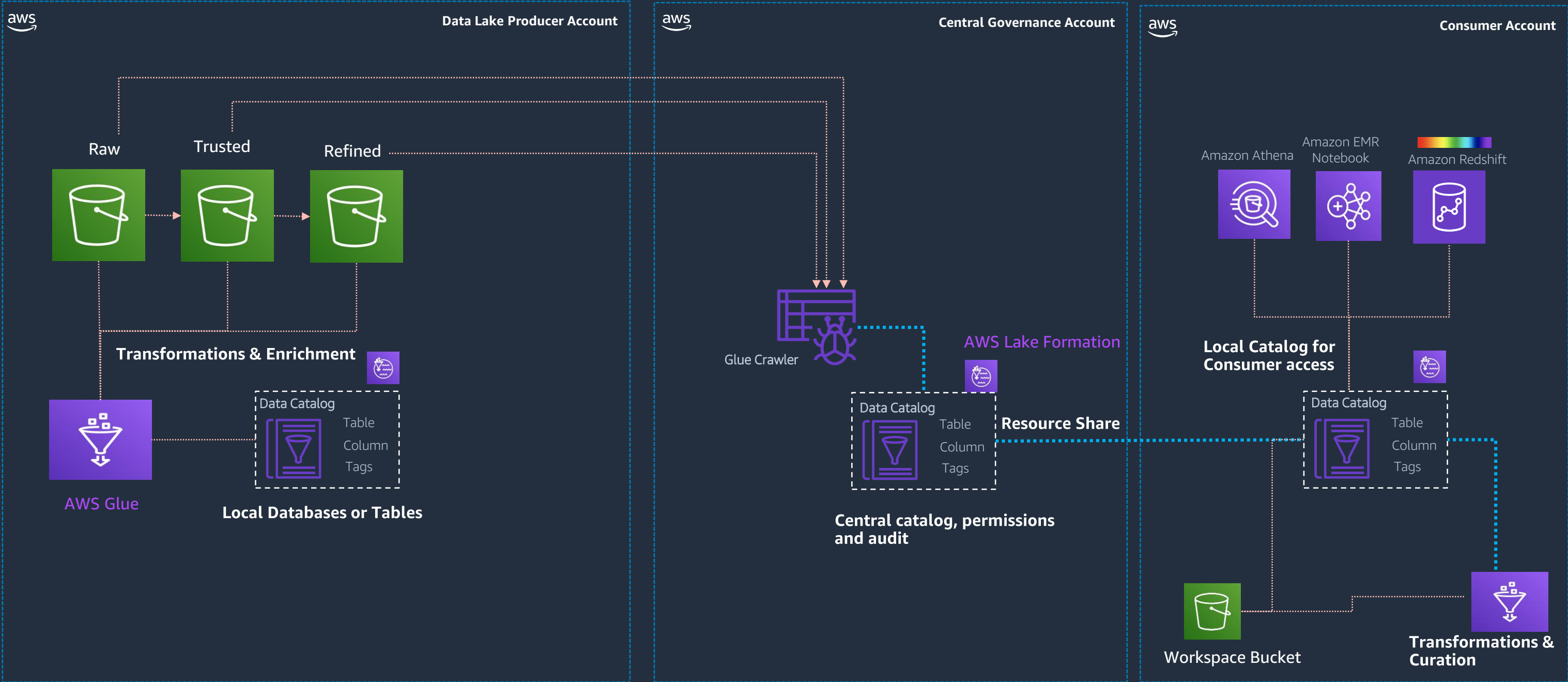
The D2C logo, consisting of the letters "D2C" in white, centered within an orange, multi-pointed starburst shape.

D2C

*"... To work on the data lake with **multiple AWS accounts**, we need a central metadata catalog ... Using the **cross account database/table sharing of AWS Lake Formation**, we are able to **achieve** our **goal easily**, without affecting the existing workload ... the ability to manage data by **column enables more sophisticated data management**."*

Rinichiro Nagatomo  
Technical lead  
Data management platform  
D2C Inc.

# Data Mesh with Central Governance



# AWS Lake Formation

Build a secure data lake in days



## Build data lakes quickly

Move, store, update, and catalog your data faster  
Automatically organize and optimize your data



## Simplify security management

Centrally define and enforce security, governance, and auditing policies



## Easily discover and share data

Catalog all of your data assets and easily share datasets between consumers



# Getting started

Lake Formation is generally available in the following Regions

Americas	EMEA	Asia
Montreal	Frankfurt	Mumbai
North California	Ireland	Seoul
Northern Virginia	London	Singapore
Ohio	Milan	Sydney
Oregon	Stockholm	Tokyo
Sao Paulo	Paris	Hong Kong
GovCloud		Beijing

Start today: <https://aws.amazon.com/lake-formation>

Sign up for the preview: [https://pages.awscloud.com/Lake\\_Formation\\_Feature\\_Preview.html](https://pages.awscloud.com/Lake_Formation_Feature_Preview.html)

# Thank you!

Roy Hasson

LinkedIn: [/in/royhasson](https://www.linkedin.com/in/royhasson)

